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# Cyber–Physical System Security of Distribution Systems

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# Foundations and Trends<sup>®</sup> in Electric Energy Systems

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# Cyber–Physical System Security of Distribution Systems

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Alexandru Stefanov<sup>2</sup>, Jennifer Appiah-Kubi<sup>1</sup>, Chih-Che Sun<sup>3</sup>, Jin  
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## ABSTRACT

The Information and Communications Technology (ICT) for control and monitoring of power systems is a layer on top of the physical power system infrastructure. The cyber system and physical power system components form a tightly coupled Cyber–Physical System (CPS). Sources of vulnerabilities arise from the computing and communication systems of the cyber–power grid. Cyber intrusions targeting the power grid are serious threats to the reliability of electricity supply that is critical to society and the economy. In a typical Information Technology environment, numerous attack scenarios have shown how unauthorized users can access and manipulate protected information from a network domain. The need for cyber security has led to industry standards that power grids must meet to ensure that the monitoring, operation, and control functions are not disrupted by cyber intrusions. Cyber security technologies such as encryption and authentication have been deployed on the CPS. Intrusion or anomaly detection and mitigation

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Chen-Ching Liu, Juan C. Bedoya, Nitasha Sahani, Alexandru Stefanov, Jennifer Appiah-Kubi, Chih-Che Sun, Jin Young Lee and Ruoxi Zhu (2021), “Cyber–Physical System Security of Distribution Systems”, *Foundations and Trends® in Electric Energy Systems*: Vol. 4, No. 4, pp 346–410. DOI: 10.1561/31000000026.

tools developed for power grids are emerging. This survey paper provides the basic concepts of cyber vulnerabilities of distribution systems and CPS security. The important ICT subjects for distribution systems covered in this paper include Supervisory Control And Data Acquisition, Distributed Energy Resources, including renewable energy and smart meters.

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# 1

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## Introduction

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Threats of cyberattacks targeting the electric power grid have been increasing in recent years (SANS, 2016; Clavel *et al.*, 2015). The consequence of cyber incidents on the power grid includes equipment damage, cascading events, large-scale power outages, and disruption of market functions (Cheng *et al.*, 2017; Sridhar *et al.*, 2012; Spolar, 2012). Government and industry have made a significant effort to strengthen the protection of the power infrastructure against cyber threats by setting standards and guidelines (e.g., Smith, 2014; Khalifa *et al.*, 2011; Sun *et al.*, 2016; Sun *et al.*, 2018; NIST, 2010; NIST, 2014).

- Critical Infrastructure Protection, Presidential Directive PDD-63, 1998.
- Cyber Security Roadmap for Energy Delivery Systems, Department of Energy (DOE), 2011.
- Guidelines for Smart Grid Cyber Security, National Institute of Standards and Technology (NIST) Report 7628.
- Critical Infrastructure Protection (CIP) Standards, Cyber Security CIP 002-014, North American Electric Reliability Corporation (NERC).

- National Electric Sector Cybersecurity Organization Resource (NESCOR), Electric Power Research Institute (EPRI).
- European Programme for Critical Infrastructure Protection (EPCIP) resulting from the European Commission's directive EU COM (2006).

As power systems become more complex and dependent on the Information and Communications Technology (ICT), the cyber system and physical system are highly connected and, therefore, the threat of cyberattacks on the power grid also increases. Intruders seeking to cause damages to the grid can compromise the communication systems to launch an attack on the power grid.

In December 2015, the power grid in Ukraine experienced a cyberattack by hackers (Ahern, 2017; Liang *et al.*, 2017). The damage caused by the sophisticated attack was a power outage affecting about 225,000 customers for about 6 h. The hacker implemented malware using a phishing email to obtain the VPN credential. From this attack, the hacker launched remote control actions through the control center computers. Denial of Service (DoS) attacks jammed phone reports of the outage to the call center. Furthermore, the data destruction software, KillDisk, was used to erase the reboot software in the workstation, causing a delay in power system restoration. Further observations can be made concerning the Ukraine attack scenario: (1) First, the hackers were knowledgeable about the operation of the targeted grid, (2) the hackers were able to manipulate the cyber–power system (CPS) from the Distribution System Operator (DSO) control center, and (3) the hackers had knowledge of critical control and operation devices. The in-depth information was obtained by penetrating the Supervisory Control And Data Acquisition (SCADA) system and staying undetected for at least 6 months. After observing for 6 months, the hackers gained sufficient knowledge about the operation and critical information of the power system. With the information garnered, the hacker(s) conducted an attack through the SCADA system to operate circuit breakers in the substations, causing a power outage.

As demonstrated by the real-world cyberattack, it is critical to fully understand the vulnerabilities of the CPS to develop the capabilities for

detecting cyber intrusions and take timely mitigation actions. Although cyber intrusions can be launched by compromising control center computers, damages could also be caused by man-in-the-middle attacks on the communication system between the control center and field devices. Therefore, the defense of the communication system is a critical issue for power systems.

Cyber security issues arise when power system components are provided with remote monitoring and control capabilities over public communication infrastructures. Remote monitoring and control for power grids have been the industry practice. This would not be a problem if the utility communication networks are private and isolated from the Internet. The problem is that the utility private communication networks, Operational Technology (OT) systems, for substation and control center communications may be connected with the general Information Technology (IT) systems used for other purposes (Nazir *et al.*, 2017) such as electricity trading, and these IT systems are in turn connected to the Internet. While there are firewalls between IT and OT systems, the firewalls may have vulnerabilities. Furthermore, some distribution system operators use public communication networks for their distribution networks (Nazir *et al.*, 2017) such as 3G/4G/5G for the pole-mounted devices. They also communicate with the control centers.

Development of the Smart Grid in recent years by large-scale deployment of ICT leads to fast-increasing connectivity of devices and systems in the power grid. Smart grid development in the United States is primarily concerned with Phasor Measurement Units (PMUs) for the transmission system as well as remote control switches and voltage/var control devices in the distribution systems. The remote monitoring and control capabilities are also created for millions of smart meters at the customer locations and DERs, including renewable energy, energy storage, and responsive load. Indeed, Advanced Metering Infrastructure (AMI) has been installed for communication and control between the utility company and numerous smart meters. As a result of the DERs, the architecture of the power grid is rapidly evolving from a centralized utility service to a distributed or decentralized structure (Liu *et al.*, 2016b). For example, Hawaii reached 23% of

renewable electricity while California has 26% renewable (Sgouras *et al.*, 2017; Finster and Baumgart, 2015) and targets a 50% level by 2030. Deployment of DERs is often conducted by nonutility parties and, therefore, the utility system may not have full control of the devices. AMI also brings new communication and control features through smart meters. As a result, additional risks emerge due to a large number of devices and noncontrollable access points (Liu *et al.*, 2016a; INL, 2007; INL, 2008; Rohde, 2005).

This survey paper is intended to serve as a module in senior-level undergraduate as well as graduate courses in power engineering. The objective of this paper, therefore, is to provide fundamental concepts of cyber security for the distribution system as a CPS. To meet the objective, vulnerabilities of cyber intrusions and mitigation strategies are discussed. The remaining sections are organized as follows. The evolution of the ICT for the power grid, sources of vulnerabilities, and cyber security measures are presented in Section 2. Sections 3 and 4 describe the ICT in the power system environment. Section 5 focuses on the cybersecurity issues of a distribution system, while Section 6 discusses smart grid communication standards and protocols. In Section 7 detection of cyber intrusions in distribution systems is considered. Mitigation strategies are provided in Section 8. Simulation cases based on the CPS model are presented in Section 9, and the paper is concluded in Section 10.

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